







#### Lawrence Berkeley National Laboratory

# The Future of Large Scale Visual Data Analysis

## Joint Facilities User Forum on Data Intensive Computing Oakland, CA

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16 June 2014

# The World that Was: Computational Architectures

- Machine architectures
  - Single CPU, single core
  - Vector, then single-core MPPs
  - "Large" SMP platforms
  - Relatively well balanced: memory, FLOPS,I/O





# The World that Was: Software Architecture

- Data Analysis and Visualization (DAV)
   Software
  - Subroutine-callable libraries
  - MPI-per core executables
  - And a generation of single-threaded apps

NCAR graphics VisIt, ParaView ferret, CDAT, gnuplot AVS, DX, ...



#### The World that Was: Use Models

- Post Hoc
  - Simulations save data to disk
    - Question: how much support to uses have centers given for parallel I/O over the years? (footnote)
  - Later, have a look at what was saved
  - Some noteworthy exceptions:
    - Cactus PSE for building codes and plugging in "thorns" that do vis/analysis
    - CUMULVS (ca 2004) computational steering/vis
    - Other custom solutions



### The World that Will Be: Slide of Doom (1)

		"2018"		
System Parameter	2011	Swim Lane 1	Swim Lane 2	Factor Change
System Peak	2  Pf/s	1  Ef/s		500
Power	6  MW	$\leq 20 \text{ MW}$		3
System Memory	0.3 PB	32–64 PB		100-200
Total Concurrency	$225\mathrm{K}$	$1B\times10$	$  1B \times 100$	40,000-400,000
Node Performance	$125 \; \mathrm{GF}$	1 TF	10 TF	8-80
Node Concurrency	12	1,000	10,000	83-830
Network BW	$1.5~\mathrm{GB/s}$	$100 \; \mathrm{GB/s}$	$1000~\mathrm{GB/s}$	66-660
System Size (nodes)	18700	1,000,000	100,000	50-500
I/O Capacity	15 PB	300–1000 PB		20-67
I/O BW	$0.2~\mathrm{TB/s}$	$20-60 \; \mathrm{TB/s}$		10-30

Aggregate concurrency grows by O(5-6) Memory grows by O(2): less memory per core. I/O capacity, BW grows by O(1): can't save all data.



#### The World that Will Be: Use Models

## For computational and experimental science:

- Post hoc. There will always be data products.
- <u>In situ.</u> Do vis/analysis while data still resident in memory.
- In transit. Do vis/analysis on a "nearby machine", but don't save to storage first.
- Workflow, work orchestration. Sequences of compute and data-centric operations.



### **Implications of Changing Architecture**

- Vis/analysis codes need to be retooled to operate on new architectures
  - Many more cores/processor
  - Much less memory/core than in the past
  - Power constraints
- Likely to be as "disruptive" as the phasechange from scalar to MPP
- Doing MPI per core won't work, explicit threading unlikely to work.



#### The Cost of MPI per core

Howison, Bethel, Childs. MPI-hybrid parallelism for volume

- Per PE memory rendering on larrge, mult-core systems. EGPGV, 2010.
  - About the same at 1728, over 2x at 216000.
- Aggregate memory use:

About 6x at 1728, about 12x at 216000.

Cores Mode	MPI PEs	MPI Runtime Memory Usage			
	Mode	MILITES	Per PE (MB)	Per Node (MB)	Aggregate (GB)
1728	MPI-hybrid	288	67	133	19
1728	MPI-only	1728	67	807	113
13824	MPI-hybrid	2304	67	134	151
13824	MPI-only	13824	71	857	965
46656	MPI-hybrid	7776	68	136	518
46656	MPI-only	46656	88	1055	4007
110592	MPI-hybrid	18432	73	146	1318
110592	MPI-only	110592	121	1453	13078
216000	MPI-hybrid	36000	82	165	2892
216000	MPI-only	216000	176	2106	37023

### The Cost of MPI per core

Lessons learned:

Co

138

138

466

466

1105

1105

- Doing MPI-per-core is not a sustainable solution at extreme scale
- MPI+X runs faster, uses less memory, moves less data.

Thought about the future:

- Likely the case that explicit threading will run into the same barriers: limits caused by the weight of the overhead.
- Implicit parallelism (e.g., data parallel) holds much promise (e.g., CUDA does this on GPUs)

216000 MPI-hybrid 36000 82 165 2892 216000 MPI-only 216000 176 2106 37023

### Implications of Changing Use Models

- Doing full-resolution data saves for post hoc analysis/vis likely not practical (possible?)
- Migration from post hoc to in situ
  - Codes need to be retooled:
    - Past: calls to I/O library
    - Future: calls to *in situ* infrastructure (footnote)
  - Implications for sharing limited resources
    - Cores, memory, data movement, power budget



#### Overview of In Situ Infrastructure

ADIOS	Code modification required	I/O based, user-pluggable processing, can do I/O, runtime configurable, non-zero copy, inline data transformations, staging.
GLEAN	No code modification required	I/O intercept, user extensible analysis (via the GLEAN API), staging.
VisIt/Libsim	Code modification required	Tightly coupled, zero-copy (in progress), connects simulation to VisIt client.
ParaView/ Catalyst	Code modification required	Tightly coupled, zero-copy, connects simulation to ParaView.



### Implications of Changing Use Models

- Increasing emphasis on complex workflows (productivity)
  - Coupling between simulation, experiment
  - End-to-end view of data solutions
    - Data management, processing, movement, analysis, vis, sharing/publishing, curation
  - Automation of formerly (presently?) manual operations



#### How is the community responding?

- Increasing portability and parallelism.
  - Several research projects focusing on DSL-like approach for expressing algorithms, achieving high concurrency and platform portability (DAX, EAVL, PISTON, etc)
    - Note: the same kind of thing is happening across many communities, including ML
- Infrastructure for legacy and future applications?
  - Problem: VisIt and ParaView in widespread use
  - Solution: SciDAC3 SDAV & vtk-m (2-3 yrs out)



#### How is the community responding?

- 5-10 years out
  - In situ infrastructure matures
  - Less distinction between "analysis" and "vis"
    - It may be data features or statistics that are viewed rather than raw field/particle/mesh data
    - Analysis of flow (e.g.), want to "see" analysis results
  - Evolving data software stack
    - Accommodates major exascale challenges: resiliency, power, portability, resource mgt



# Future of Large Scale Visual Data Analysis

- Code teams and in situ:
  - "Resistance is futile."
- Computing facilities:
  - Users will need help with in situ, workflow infrastructure.
    - Question: how support to users have centers provided over the years for parallel I/O?
  - The future data-centric software will be much more complex than what you've seen in the past.



# Future of Large Scale Visual Data Analysis

- Vis/analysis infrastructure will be ready for future architectures
  - This very subject consumes a large fraction of R&D funding.
- Partnering with facilities and code teams is a key element of achieving that objective
  - Data-centric projects/pilots help push the limits of technology and prepare you for the future.





